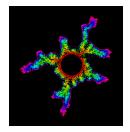
# Scaling Limits of Laplacian Random Growth Models

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# Biological growth



Photo by James Wearn

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# Biological growth



Gift by Sir Alexander Fleming to Edinburgh University Library, Scotland

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# Mineral deposition



Photo by Kevin R Johnson

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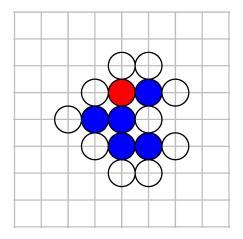
### Mineral deposition



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### Lattice models for random growth

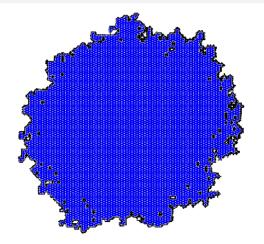


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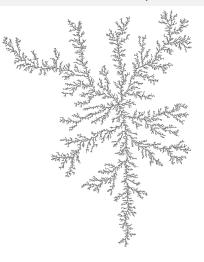
# Eden model for biological growth (1,500 particles)



Simulation by H.J. Herrmann

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### DLA cluster for mineral deposition (2,000 particles)



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Scaling Limits of Laplacian Random Growth Models

👝 Simulation by Vincent Beffara 🛛 🖉 🔿 🔍 (~

# Other lattice models for random growth

- Dielectric breakdown models (DBM)
- Internal diffusion-limited aggregation (IDLA)
- First passage percolation (FPP)
- Interface models: ballistic deposition, corner growth model, etc.

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### What do we know about DLA?

#### Not much!

• H. Kesten: At time t DLA is contained in a ball of radius  $t^{2/3}$ .

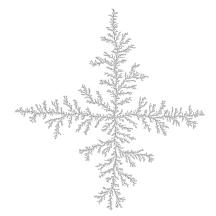
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No proof DLA does not converge to a ball.

 Main open problems: Existence of universal limit. Growth rate of the cluster. Structure of the limiting set (e.g. fractal dimension). Number of arms.

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### DLA cluster of size 4,096

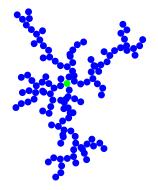


Simulation by Vincent Beffara

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# Off-lattice DLA



Ball shaped particles perform BM (from infinity) until they attach to the aggregate.

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### Harmonic measure

- The attachment point is distributed according to harmonic measure on the cluster boundary (from infinity).
- By conformal invariance of BM, harmonic measure is conformally invariant.
- An algorithm for sampling a boundary point of a set A: Let  $D_0$  denote the exterior unit disk in the complex plane  $\mathbb{C}$ and let  $\Phi : D_0 \to A^c$  be conformal. Choose a point  $y \in \partial D_0$ uniformly. Then take  $\Phi(y)$ .

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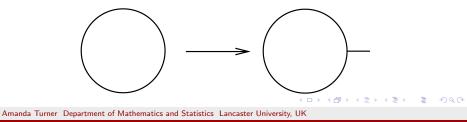
# Conformal mapping representation of a slit-shaped particle

Let *P* denote the slit  $[1, 1 + \delta]$  in the complex plane.

There exists a unique conformal mapping  $F: D_0 \to D_0 \setminus P$  that fixes  $\infty$  in the sense that

$${\sf F}(z)=e^{c}z+O(1)$$
 as  $|z| o\infty,$ 

for some c>0, the (log of the) capacity, which satisfies  $e^c=1+rac{\delta^2}{4(1+\delta)}.$ 



### Conformal mapping representation of a cluster

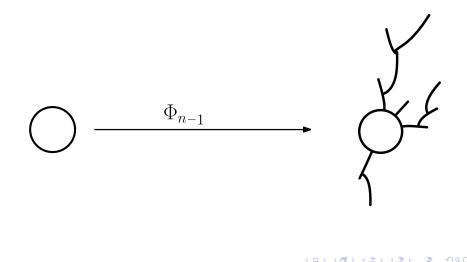
Suppose P<sub>1</sub>, P<sub>2</sub>,... is a sequence of particles, where P<sub>n</sub> has capacity c<sub>n</sub> (or length δ<sub>n</sub>) and attachment angle Θ<sub>n</sub>, n = 1, 2, .... Let F<sub>n</sub> be the particle map corresponding to P<sub>n</sub>.

• Set 
$$\Phi_0(z) = z$$

- Recursively define  $\Phi_n(z) = \Phi_{n-1} \circ F_n(z)$ , for n = 1, 2, ...
- This generates a sequence of conformal maps  $\Phi_n : D_0 \to K_n^c$ , where  $K_{n-1} \subset K_n$  are growing compact sets, which we call clusters.

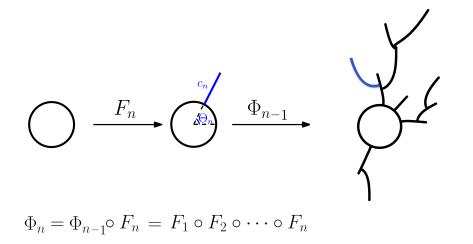
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# Cluster formed by iteratively composing mappings



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# Cluster formed by iteratively composing mappings



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### Parameter choices for physical models

- By varying the sequences {Θ<sub>n</sub>} and {c<sub>n</sub>}, it is possible to describe a wide class of growth models.
- For biological growth (Eden model)

$$\mathbb{P}(\Theta_n \in (a,b)) \propto \int_a^b |\Phi_{n-1}'(e^{i heta})| d heta$$

and

$$c_n \approx c |\Phi'_{n-1}(e^{i\Theta_n})|^{-2}$$

For DLA, *c<sub>n</sub>* is as above and

$$\mathbb{P}(\Theta_n \in (a,b)) = \mathbb{P}(\Phi_{n-1}^{-1}(B_{\tau}) \in (a,b)) \propto (b-a)$$

where  $B_t$  is Brownian motion started from  $\infty$  and  $\tau$  is the hitting time of the cluster  $K_{n-1}$ .

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# Further examples of Laplacian models within this framework

• Hastings-Levitov family,  $HL(\alpha)$  [1998]:

•  $\theta_n$  are i.i.d.  $U(-\pi, \pi)$  random variables;

$$c_n = c |\Phi'_{n-1}(e^{i\theta_n})|^{-\alpha}.$$

Dielectric-breakdown models, DBM(η) [due to Hastings, 2001, and Mathiesen-Jensen, 2002]:

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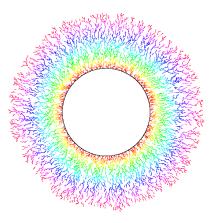
• 
$$\theta_n$$
 distributed  $\propto |\Phi'_{n-1}(e^{i\theta})|^{1-\eta} d\theta$   
•  $c_n = c |\Phi'_{n-1}(e^{i\theta_n})|^{-2}$ .

Aggregate Loewner Evolution, ALE(α, η, σ) [due to Sola-Viklund-T., 2019]:

• 
$$\theta_n$$
 distributed  $\propto |\Phi'_{n-1}(e^{\sigma+i\theta})|^{-\eta}d\theta;$   
•  $c_n = c|\Phi'_{n-1}(e^{\sigma+i\theta_n})|^{-\alpha}.$ 

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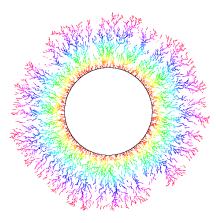
# HL(0) cluster with 8,000 particles for $c = 10^{-4}$



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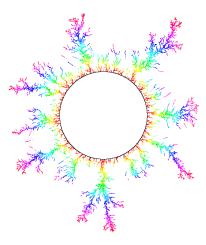
# "Eden" cluster with 8,000 particles for $c = 10^{-4}$



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# "DLA" cluster with 8,000 particles for $c = 10^{-4}$

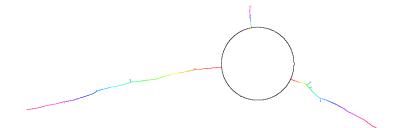


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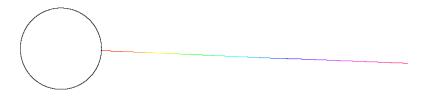
# ALE(0,2,10<sup>-8</sup>) cluster with 10,000 particles for $c = 10^{-4}$



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# ALE(0,4,10<sup>-8</sup>) cluster with 10,000 particles for $c = 10^{-4}$



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# Previous results for HL(0)

Much of the previous work relates to HL(0) as particle maps are i.i.d. so the model is mathematically the most tractable.

- Norris and Turner (2012):
  - small-particle scaling limit of HL(0) is a growing disk:  $\Phi_n(z) \approx e^{cn}z$
  - branching structure is related to the Brownian web
  - expected size of the  $n^{th}$  particle is roughly  $\delta \exp cn$ , so HL(0) is "unphysical".

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 Silvestri (2017): fluctuations converge to a log-correlated Fractional Gaussian Field.

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#### Loewner chain representation

Define the driving measure  $\mu_t = \delta_{e^{i\xi_t}}$  , where

$$\xi_t = \sum_{k=1}^N \Theta_k \mathbb{1}_{(C_{k-1}, C_k]}(t),$$

with  $C_k = \sum_{j=1}^k c_k$ , for angles  $\{\Theta_k\}$  and capacities  $\{c_k\}$  as above. Consider the solution to the Loewner equation

$$\partial_t \Psi_t(z) = z \Psi_t'(z) \int_0^{2\pi} \frac{z + e^{i\theta}}{z - e^{i\theta}} d\mu_t(e^{i\theta}),$$

with initial condition  $\Psi_0(z) = z$ .

Then

$$\Phi_n = \Psi_{C_n}, \quad n = 0, 1, 2, \dots$$

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### Continuity properties of the Loewner equation

- Solutions to the Loewner equation are close if the driving measures are close in some suitable sense.
  - Suppose  $\mu^n = {\mu_t^n}_{t \ge 0}$ , n = 1, 2, ..., and  $\mu = {\mu_t}_{t \ge 0}$  are families of measures on the unit circle  $\mathbb{T}$ .
  - Let  $\Psi_t^n$  be the solution to the Loewner equation corresponding to  $\mu^n$  and  $\Psi_t$  be the solution corresponding to  $\mu$ .
  - To show that  $\Psi_t^n \to \Psi_t$  uniformly on compact subsets of  $D_0$ , it is enough to show that

$$\int_{\mathbb{T}\times[0,\infty)} f(e^{i\theta},t) d\mu_t^n(e^{i\theta}) dt \to \int_{\mathbb{T}\times[0,\infty)} f(e^{i\theta},t) d\mu_t(e^{i\theta}) dt$$

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for all continuous functions f in  $\mathbb{T}\times [0,\infty)$  with compact support.

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### Proof of disk scaling limit for HL(0)

If  $\mu^{c}$  is the driving measure for HL(0) then  $\mu^{c}_{t} = \delta_{e^{i\xi_{t}}}$ , where

$$\xi_t = \sum_{k=1}^{\infty} \Theta_k \mathbb{1}_{(c(k-1),ck]}(t).$$

Set  $n(t) = \lfloor t/c \rfloor$ . Then, if f is supported on  $\mathbb{T} \times [0, T]$ ,

$$\int_{\mathbb{T}\times[0,\infty)}f(e^{i\theta},t)d\mu_t^cdt=c\sum_{k=1}^{n(\mathcal{T})}f(e^{i\Theta_k},c(k-1))+o(c).$$

When  $\mu$  is the uniform measure on  $[0, 2\pi)$ ,

$$\int_{\mathbb{T}\times[0,\infty)}f(e^{i\theta},t)d\mu_t dt=\frac{1}{2\pi}\int_0^T\int_0^{2\pi}f(e^{i\theta},t)dt.$$

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# Proof of disk scaling limit for HL(0) (cont.)

By Riemann approximation,

$$rac{c}{2\pi}\sum_{k=1}^{n(T)}\int_0^{2\pi}f(e^{i heta},c(k-1))d heta
ightarrow rac{1}{2\pi}\int_0^T\int_0^{2\pi}f(e^{i heta},t)dt,$$

so it is enough to show that

$$c\sum_{k=1}^{n(\mathcal{T})}\left(f(e^{i\Theta_k},c(k-1))-rac{1}{2\pi}\int_0^{2\pi}f(e^{i heta},c(k-1))d heta
ight)
ightarrow 0.$$

But this follows from the strong law of large numbers, since the  $f(e^{i\Theta_k}, c(k-1))$  are independent with

$$\mathbb{E}(f(e^{i\Theta_k},c(k-1))) = \frac{1}{2\pi} \int_0^{2\pi} f(e^{i\theta},c(k-1))d\theta.$$

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### Example: Anisotropic Hastings-Levitov

- Suppose  $\Theta_n$  are i.i.d. with density  $h(\theta)$  on  $[0, 2\pi)$ .
- Suppose c<sub>n</sub> = cg(Θ<sub>n</sub>), for some bounded continuous function g on [0, 2π).
- Let  $\Psi_t$  solve

$$\partial_t \Psi_t(z) = z \Psi_t'(z) \int_0^{2\pi} \frac{z + e^{i\theta}}{z - e^{i\theta}} g(\theta) h(\theta) d\theta,$$

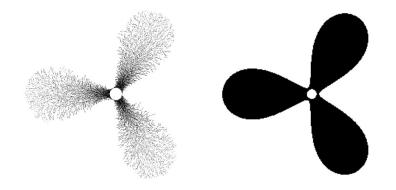
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with initial condition  $\Psi_0(z) = z$ .

**Theorem (Viklund, Sola, T. '12):** Fix T > 0. As  $c \to 0$ ,  $\Phi_{n(T)} \to \Psi_T$  in probability.

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# Clusters with non-uniform attachment angles



Simulations by Alan Sola

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# Previous results for $HL(\alpha)$ for $\alpha \neq 0$

All results for HL( $\alpha$ ) with  $\alpha \neq 0$  require regularization.

- Rohde and Zinsmeister (2005): estimates on the dimension of scaling limits for a regularized version of HL(α) under capacity rescaling.
- Sola, Turner, Viklund (2015): small-particle scaling limit of a sufficiently regularized HL(α) is a growing disk for all α.
- Liddle and Turner (2020): fluctuations for very regularized HL(α) under capacity rescaling.
- Norris, Turner, Silvestri (2019 and 2021): disk scaling limit and fluctuations for  $HL(\alpha)$  when  $\alpha \leq 1$  (under mild regularization).

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# Singular-regime results for ALE( $\alpha, \eta, \sigma$ )

- Sola, Turner, Viklund (2019): scaling limit of ALE(α, η, σ) is a growing slit if α ≥ 0 and η > 1 when using slit particles, provided σ → 0 sufficiently fast as c → 0.
- Higgs (2021): scaling limit of ALE(0, η, σ) converges to a SLE<sub>4</sub> for η < −2 when using slit particles, provided σ is very small. Other SLE<sub>κ</sub>'s with κ > 4 can be obtained by using different particle shapes.

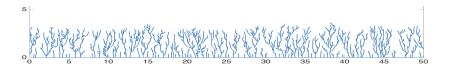


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### Other model variants

- Turnbull and Turner (2020): HL(0) with competition
- Berestycki and Silvestri (2021): Constrained HL(0)
- Berger, Turner, Procaccia (2021): Stationary HL(0)



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# Open questions / conjectures

#### Phase transitions

- From disks to non-disks
- From absolutely continuous support to singular support

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- Universality
  - Of scaling limits
  - Of fluctuations
- Connections
  - Between model variants
  - With lattice models
  - With SLE
  - With GMC

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#### References

[1] M.B.Hastings and L.S.Levitov, *Laplacian growth as one-dimensional turbulence*, Physica D 116 (1998).

[2] F.Johansson Viklund, A.Sola, A.Turner, *Small particle limits in a regularized Laplacian random growth model*, CMP, 334 (2015).

[3] J.Norris, V.Silvestri, A.Turner, *Scaling limits for planar aggregation with subcritical fluctuations*, arXiv:1902.01376.

[4] J.Norris, A.Turner, *Hastings-Levitov aggregation in the small-particle limit*, CMP, 316 (2012).

[5] S.Rohde, M.Zinsmeister *Some remarks on Laplacian growth,* Topology and its Applications, 152 (2005).

[6] A.Sola, A.Turner, F.Viklund, *One-dimensional scaling limits in a planar Laplacian random growth model*, CMP, 371 (2019).

[7] V.Silvestri, Fluctuation results for Hastings-Levitov planar growth. PTRF, 167 (2017).

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